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Quantifying uncertainties in precipitation: a case study from Greece

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Abstract. The main objective of the present study was the examination and the quantification of the uncertainties in the precipitation time series over the Greek area, for a 42-year time period. The uncertainty index applied to the rainfall data is a combination (total) of the departures of the rainfall season length, of the median data of the accumulated percentages and of the total amounts of rainfall. Results of the study indicated that all the stations are characterized, on an average basis, by medium to high uncertainty. The stations that presented an increasing rainfall uncertainty were the ones located mainly to the continental parts of the study region. From the temporal analysis of the uncertainty index, it was demonstrated that the greatest percentage of the years, for all the stations time-series, was characterized by low to high uncertainty (intermediate categories of the index). Most of the results of the uncertainty index for the Greek region are similar to the corresponding results of various stations all over the European region.

1 Introduction

The quantification the assessment and the understanding of the uncertainties in several climatological parameters are of major interest in recent climate studies. Especially, in the case of precipitation, the identification of the uncertainties associated with the rainfall time series is considered to be crucial, as it influences many aspects of the human activity, such as agriculture, tourism and water management. Maskey et al. (2004) mentioned that for the rainfall – runoff models and for the flood forecasting, the precipitation uncertainty represents the major part of the input uncertainty. Therefore, the output of these models could be improved if the uncer-

tainties of precipitation are estimated. The quantification in time and space of these uncertainties would also contribute to the improvement of the reanalysis models (Smith et al., 2001).

Paz and Kutiel (2003) demonstrated that the "climatic uncertainty" is the inability to accurately forecast the magnitude of a certain climatic variable at a specific location and time. They divided the uncertainties into three categories: temporal, spatial and magnitudinal uncertainties, a division that was also used by Maskey et al. (2004). Also, Thorne et al. (2005) identified two different sources of uncertainties, the structural and parametric uncertainty. The first one arises through the choice of approach, while the latter one gives the chosen approach in the presence of a finite sample of data.

This study is motivated by an interest in examining and estimating the spatial and temporal uncertainty of precipitation over the Greek region. The precipitation regime in the study area is generally characterized by a long dry summer, especially in the islands of the central Aegean Sea and the wet period (during winter) is considered quite clearly distinct. However, the great influence of local factors often results in several cases to an irregular behavior of precipitation, thus numerous studies have analyzed the characteristics of the rainfall regime in Greece (Theoharatos and Tselepidaki, 1990; Maheras et al., 1992; Fotiadi et al., 1999; Bartzokas et al., 2003; Anagnostopoulou et al., 2003; Tolika and Maheras, 2005). Considering that the examination of the uncertainties associated with precipitation is limited, this study aims in this direction.
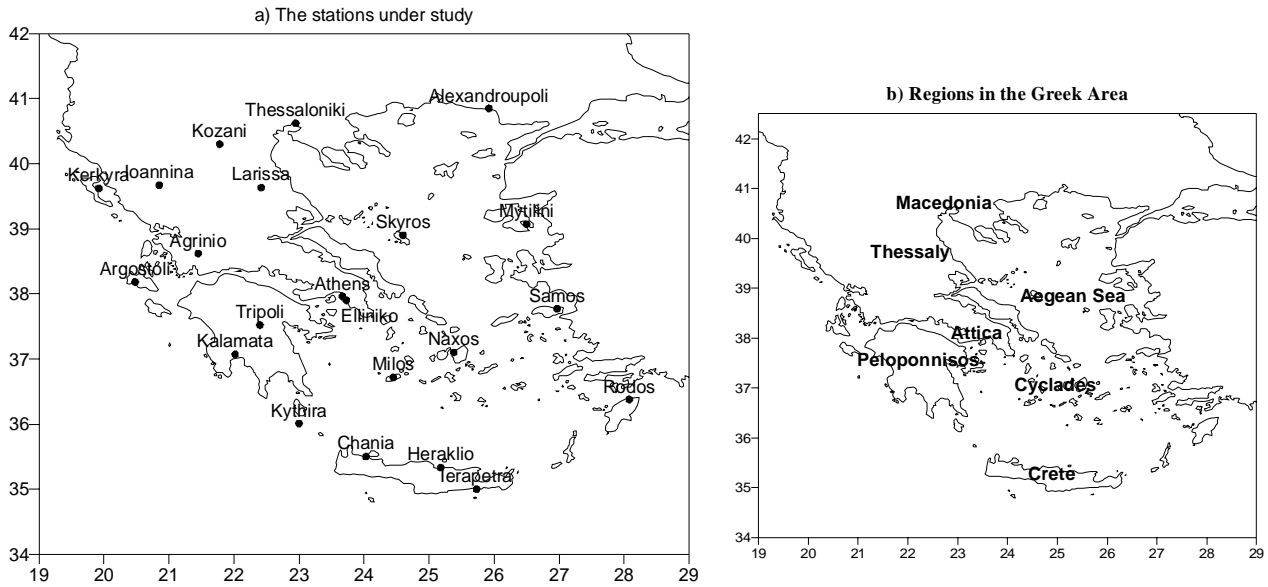
2 Methodology – data

2.1 Data

The study is based on daily rainfall totals from a dense network of 22 stations located at the Greek region (Fig. 1), covering the 1958–1999 period. All the rainfall time se-

Fig. 1. The geographical distribution of the stations **(a)** and the geographical location of the Greek regions **(b)** used in the study.

ries used were checked for homogeneity with Alexandersson test (1986) in order to ensure the validity of the conclusions.

In the Mediterranean region, the highest amount of precipitation is observed during the winter period, while the summer rainfall is insignificant or zero. The years used in this study are hydrological years, which differ from the calendar year. We define the 1 September as the beginning of the hydrological year and 31 August as the end. Each year is named after the date of the September that it contains, for example the 1980 year starts at 1 September 1980 and finished at 31 August 1981.

2.2 Methodology for evaluating uncertainty

Rainfall regime is affected by both the number and the length of rainspells and dryspells and the total annual rainfall. For the Greek region, a rainspell (dryspell) is defined as the number of consecutive rainy (dry) days with precipitation higher (equal or lower) than 0.1 mm (Anagnostopoulou et al., 2003; Tolika and Maheras, 2005). This threshold was selected because during spring and summer even this small amount of rain can be considered as an important factor for the growth of crops; in addition, the increase of the humidity of the air can favor the outbreak of crop diseases (Steineke and Jehle, 2004; Champeil et al., 2004). Changes in any of these parameters could introduce uncertainties to an accurately forecast of the precipitation. Paz and Kutiel (2003) introduce the following parameters in order to evaluate the uncertainty of the rainfall regime:

1. $NRS_{(d)}$ (Number of rainspells) is the number of rainspells for a given duration in days (d).

2. $RSY_{(d)}$ (Rainspell Yield) is the average rainfall (in mm) accumulated during all rainspells of the duration of the Rainy Seasonal Length (RSL, in days). The RSL is defined as:

$$RSL = DAP_{(90)} - DAP_{(10)} \qquad (1)$$

where $DAP_{(i)}$ is the median date of an accumulated percentage ($i=10, 20, \ldots, 90$) of the annual rainfall (in days since 1 September)

3. $TOTAL_{(d)}$ is the total rainfall (in mm) given as follows:

$$TOTAL_{(d)} = NRS_{(d)} * RSY_{(d)} \qquad (2)$$

Furthermore, Paz and Kutiel (2003) defined the Uncertainty Index (UI) as:

$$UI = \Delta RSL + \Delta DAP + \Delta TOTAL \qquad (3)$$

It is composed of a series of standardized components that measure the uncertainty:

$$\Delta RSL = \left| \frac{RSL - Med_{RSL}}{\sigma(RSL)} \right| \qquad (4)$$

where Med_{RSL} is the median value of RSL and $\sigma(RSL)$ is its standardized deviation

$$\Delta DAP = \frac{\sum_{i=10}^{90} \left| \frac{DAP_i - MedDAP_i}{\sigma DAP_i} \right|}{z} \qquad (5)$$

where MedDAP$_{(i)}$ is the median value of DAP(i) and z is the number of the accumulated percentage (i=10, 20, ..., 90), in our study is 9.

$$\Delta \text{TOTAL} = \frac{\sum_{i=1}^{z} \left| \frac{\text{TOTAL}_{(d)} - \overline{\text{TOTAL}_{(d)}}}{\sigma \text{TOTAL}_{(d)}} \right|}{z} \qquad (6)$$

where z is the number of the different TOTALs, in our study is 7.

All the components of the UI were calculated using the Rainfall Uncertainty Model (RUM) developed at the Laboratory of Climatology, University of Haifa, by the last two authors. Due to space limitations the full description of this model and all its components is not possible to be described in this section. A detailed description of these can be found at the website: http://geo.haifa.ac.il/~kutiel/RUEM%204.pdf.

The trend of the Rainy Seasonal Length (RSL) and the UI were calculated by a simple least squares fit, where the regression coefficient b gives the changes per year. Trend significance was tested using the Kendall –tau test at the 95% confidence level (5% significant level).

3 Results

3.1 Rainy Season Length (RSL)

The Rainy Season Length (RSL) is defined as the elapsed time between two accumulated percentages of the annual rainfall (in days since 1. September). It is dependent on location and topography, as well as the regional circulation over the study area. RSL could be regarded as a good indicator for plants growing and the surplus of water in the region. In the present study, the rainy season length between the 10% DAP and 90% DAP (90–10 RSL), 10% DAP and 50% DAP (50–10 RSL) and 50% DAP and 90% DAP (90–50 RSL) were analyzed.

The mean Rainy Season Length (90–10 RSL), for the Greek region varies from 130 to 260 days, an increase that moves gradually from southeast to northwest (Fig. 2a). The maximum and minimum Rainy Seasonal Length performs in similar modes; the northern continental regions present the higher RSL for both cases (Fig. 2b, c). This means that over north-northwestern Greece, the duration of the rainfall period is longer (about nine months) during the hydrological year, while the rainfall over southern Greece limits in shorter time periods (more than 4 months).

In order to provide a more detailed analysis, the sub-periods, 50–10 RSL and the 90–50 RSL were evaluated and analyzed. These two sub-periods were selected as they represent the two halves of the whole rainy period. Apart from these calculations, the trends of all the RSLs were also calculated. The length of the RSLs varies with time, depending also on the region. Generally, the length of the 50–10 RSL is shorter than the 90–50 RSL one, meaning that the first half
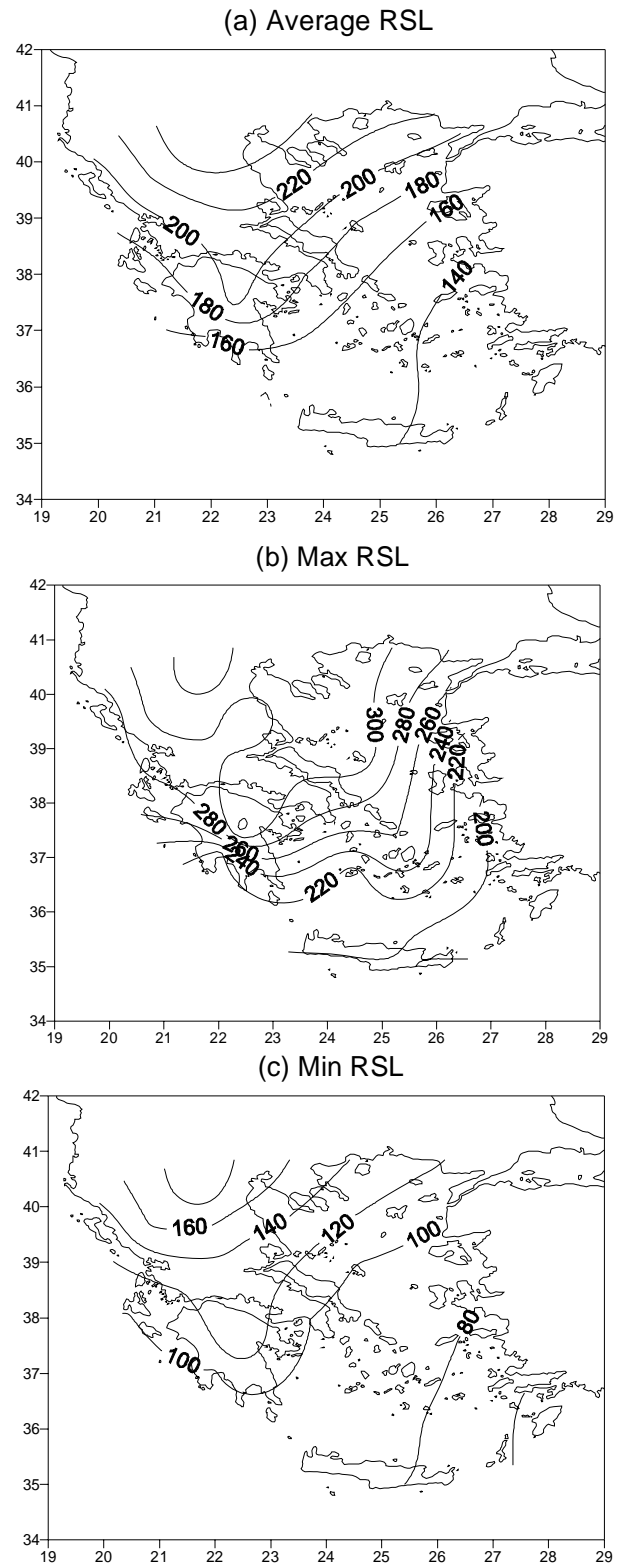
Fig. 2. Spatial distribution of the average **(a)**, max **(b)** and min **(c)** RSL for the Greek region.
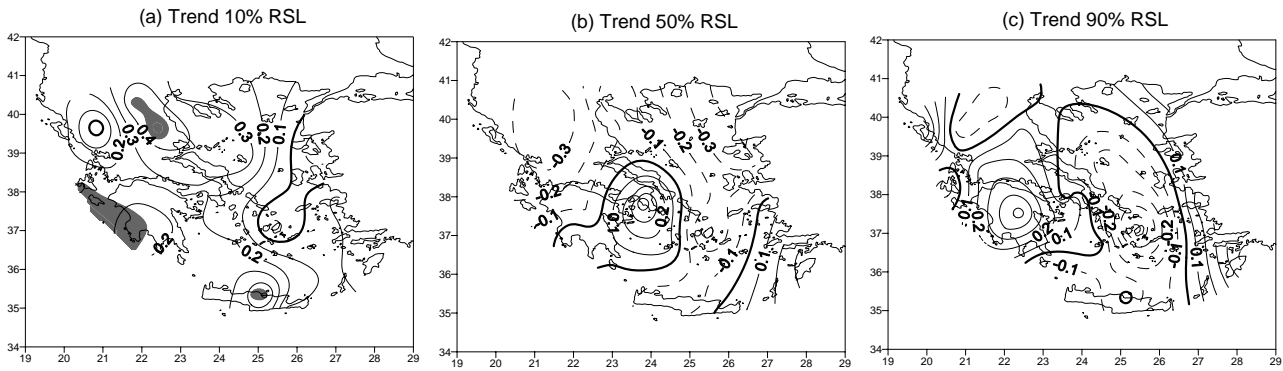
Fig. 3. The spatial distribution of the trends (day/year) of the 10%RSL **(a)**, 50%RSL **(b)** and the 90%RSL **(c)**. The grey regions indicate the statistical significant trends.

of the total rainfall is recorded in about two months duration, while the last half of the total rainfall spreads over a much longer time period (not shown). Mainly, for the continental stations the 50–10 RSL is the longest one, holding about twice the time of the other stations. On the contrary, some of the island stations present the shortest length of 90-10 RSL that is divided almost into two equal parts, 50–10 RSL and 90–50 RSL (not shown).

The trends in the three selected rainfall percentiles (10%, 50% and 90%) are shown in Fig. 3. Concerning the 10% percentile, an increase is indicated in the majority of the stations (19 stations). Up to 4 days per decade is the observed increasing trend of the 10% percentile in central continental Greece and in Crete. On the other hand, a smaller decreasing trend (1 day per decade) is found in the eastern Aegean Sea (Fig. 3a).This means that the rainy season tends to start later during the hydrological year. However, it should be mentioned that this increasing trend is statistically significant only for five stations, three continental (Kozani, Larissa and Kalamata) and two island (Heraklio and Argostoli). For the 50% percentile, a decreasing trend is evident in the three quarters of the stations, but none of them presented significant decreasing results. Fifty per cent of rainfall of the rainfall tends to appear earlier in the hydrological year (decreasing trend of 3–4 days per decade) in the northeastern and northwestern parts of the country. Conversely, in central Greece (Athens) and in the southeastern Aegean Sea the trend found is positive (up to 3 days per decade, see Fig. 3b).The 90% percentile also indicates an increasing trend, as the corresponding 10% percentile, in more than half of the stations under study. For these stations the rainy period seems to present a tendency to end later during the hydrological year, mainly in Peloponissos as well as in central continental Greece and in the station in the eastern Aegean Sea. All the other island stations of the Aegean and the stations in Crete show a decreasing trend of this percentile. Especially in the Cyclades, this negative trend reaches the value of 5 days per decade decrease (Fig. 3c). Generally, the 90–

10 RSL tends to last longer in 8 stations (island and coastal ones), while in the other 14 stations, the rainy period presents a negative trend and thus the RSL is shorter. However, at this point it should be noted that none of the RSL trends were found statistically significant (not shown).

3.2 Uncertainty Index (UI)

In the last section of the present study, an assessment is made to analyze the behavior of the uncertainty index (UI) in each of the selected stations. The spatial distribution of the mean standardized scores of the UI is presented in Fig. 4. The score values vary from 2.6 at the station of Naxos to 3.4 at the station of Athens. It can also be noted that mainly continental stations present the highest values of the index and especially in the central and northern continental Greece. However, one island station at the eastern Aegean Sea (Mytilini; 3.2) and one station on the island of Crete (Ierapetra; 3.1) present also quite high index score values. Since the selected index is a sum of three parameters (departures), it is also interesting to examine which of these three departures contributes the most to the high values of the UI. Analyzing the stations which presented a UI greater than 3.0, it is found that in most of the cases, the absolute departures of the total amount of rainfall (ΔTOTAL) play the most predominant role for the increase of the UI scores (not shown). Also, stations with high values of ΔRSL had quite high index scores, as well. However, in the case of Athens (highest index score), the high ΔTOTAL and ΔDAP are the departures that result to the increase of the uncertainty.

Figure 4 depicts also the maximum and minimum scores of the index found during the study period. Their range vary between 1.1 (absolute minimum) to 8.3 (absolute maximum). More specifically, the maximum scores of the uncertainty index present values from 4.6 at the stations of Chania and Heraklio in Crete to 8.3 at the station of Naxos in Cyclades (Fig. 4). On the other hand, the lowest values of the minimum scores are found in Kozani and Milos (1.1) and the
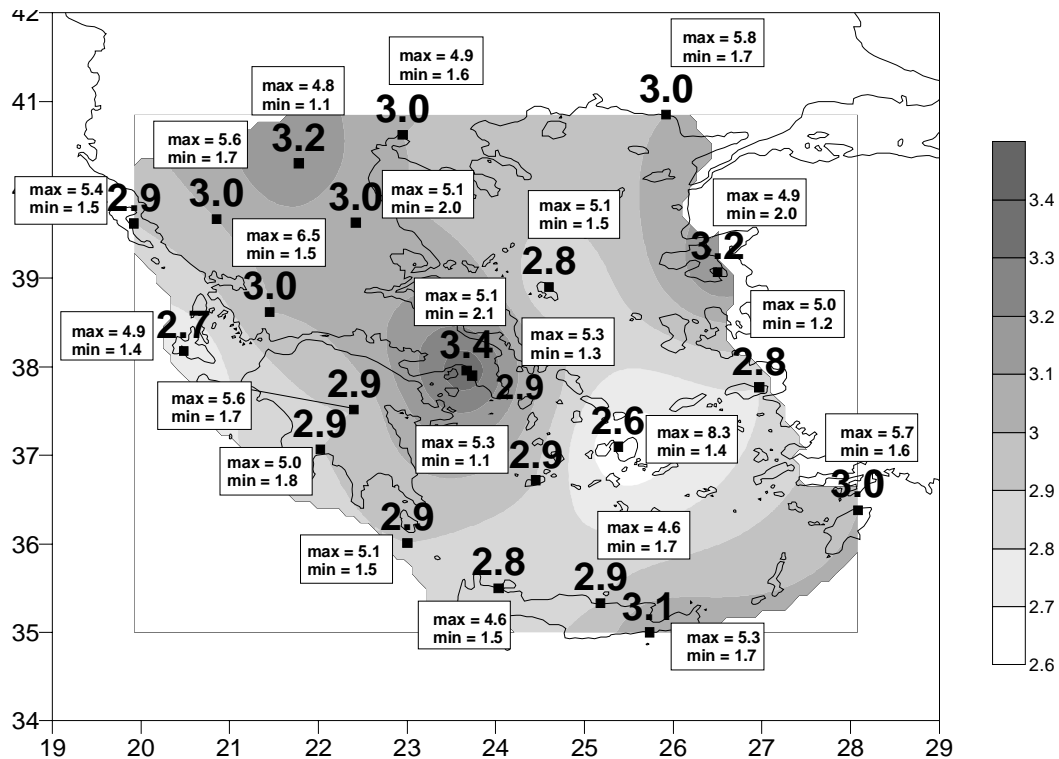
Fig. 4. The mean standardized scores both in the grey scale and over the location of each station. The numbers in the box indicate the maximum and minimum values (scores) of the index for each station.

highest ones in Athens (2.1). No general conclusion can be drawn for the years that these values appear, but in more than half of the stations both the maximum and the minimum index scores are found on the second half of the study period, suggesting that the variability of the index is greater after the year of 1978. According to Anagnostopoulou (2003) and Norrant (2004), after this year there is an important change in the atmospheric circulation over the Mediterranean and especially over Greece.

Taking all the aforementioned results under consideration and aiming at providing a more detailed analysis of the uncertainty index, their values were divided into five classes (categories):

1. UI<2.0   very low uncertainty

2. 2.0≤UI< 2.5   low uncertainty

3. 2.5≤UI< 3.0   medium uncertainty

4. 3.0≤UI< 4.0   high uncertainty

5. UI≥4.0   very high uncertainty

Using this categorization, the number of cases (in years) for each class was computed for all stations and the results are summarized in Table 1a. It is obvious that the three

medium classes are the ones with the highest frequencies: they almost double from the first and the last category. From a more thorough examination of the results, it is inferred that the station of Argostoli presents the maximum frequency in the first class; 11 years out of the 42 are characterized by very low uncertainty. The second highest frequency of this class is found for the station of Naxos with 10 years where the index scores are below 2.0. Conversely, the stations of Athens and Mytilini present high frequencies for the last class of very high uncertainty: 11 and 10 years respectively, are characterized by index scores higher than 4.0.

In order to examine if this categorization is valid and works to the same direction for other areas, the uncertainty index was calculated anew for different stations, with available data sets, all over the European and the Mediterranean region. The number of each class was calculated for each station and the results are shown in Table 1b. Generally, the stations perform the same way as the Greek stations and the three medium classes are the ones with the highest frequencies, but it should be mentioned that the last class of very high uncertainty presents lower frequency (less cases) than the equivalent one for Greece. Only the station of Salamanca in Spain shows a different behavior. In this case, the highest frequency is observed for the first class (UI<2.0) where 19 out of the 42 are characterized by very low uncertainty.

Table 1. (a) Number of cases (years) for the different classes of the Uncertainty Index (UI) for the stations over the Greek area.

	The UI classes				
	UI <2.0	2.0≤UI<2.5	2.5≤UI<3.0	3.0≤UI<4.0	UI≥4.0
Agrinio	5	9	12	9	7
Alexandroupoli	3	9	12	13	5
Argostoli	11	9	9	8	5
Athens	0	4	8	19	11
Chania	7	10	9	12	4
Elliniko	4	14	8	10	6
Heraklio	6	11	9	10	6
Ierapetra	3	6	8	23	2
Ioannina	2	10	11	11	8
Kalamata	4	12	10	11	5
Kerkyra	5	14	8	9	6
Kozani	3	7	7	19	6
Kythira	5	11	10	11	5
Larissa	0	14	10	13	5
Milos	4	10	16	6	6
Mytilini	1	10	9	12	10
Naxos	10	12	13	3	4
Rodos	4	9	11	15	3
Samos	6	13	7	13	3
Skyros	8	12	6	10	6
Thessaloniki	6	10	5	15	6
Tripoli	6	11	10	11	4
Average	4.68 (11.1%)	10.32 (24.6%)	9.45 (22.5%)	11.95 (28.5%)	5.59 (13.3%)

Table 1. (b) Number of cases (years) for the different classes of the Uncertainty Index (UI) for stations over the European region.

	The UI classes				
	UI <2.0	2.0≤UI<2.5	2.5≤UI<3.0	3.0≤UI<4.0	UI≥4.0
Berlin (Germany)	1	9	15	12	5
Bucharest (Roum.)	1	3	14	15	9
Dublin (Ireland)	5	9	14	13	1
Hamburg (Ger.)	5	11	12	8	6
Helsinki (Finland)	4	10	14	8	6
Larnaka (Cyprus)	6	6	12	16	2
Maaststricht (Neth.)	7	13	8	10	4
Milan (Italy)	1	8	7	18	8
Oxford (England)	4	7	10	19	2
Paris (France)	5	11	9	13	4
Prague (Czech.)	2	9	11	15	5
Salamanca (Spain)	19	10	6	5	2
Tel Aviv (Israel)	9	11	10	8	4
Average	5.31 (12.6%)	9.00 (21.4%)	10.9 (26.0%)	12.31 (29.3%)	4.46 (10.6%)

Just two years are found with the index scores exceeding the value of 4.0 (Table 1b). This station presents also a quite low average UI score (2.3), a value that is lower than the corresponding average values of all the stations in the Greek region.

4   Conclusions and discussion

The present study applies a new approach proposed by Paz and Kutiel (2003) for the estimation and the quantification of the spatial and temporal uncertainties associated with the

rainfall characteristics of several stations over the Greek area. The methodology developed was applied to daily precipitation time series from 22 stations distributed uniformly over the study region, but with different local characteristics. This gives the opportunity to investigate also if these local factors play an important role to the rainfall uncertainly or if the uncertainty is mainly caused by other larger-scale or regional factors.

From the analysis of the RSL, it is derived that the rainy length varies from 4 to 9 months, depending on the station. For the continental stations, the first 50% of the precipitation is observed for a longer time period, while for the insular stations the precipitation amounts are well divided into two rainy periods. It is worth mentioning also that the RSL is relocated during the study time period for the majority of the stations, meaning that the rainy season begins later and finishes also later during the hydrological year. It is also observed that the duration of the second 50% of rainfall has increased its duration. This could play an important role both in agriculture and hydrology, since the same amount of rainfall falls for a larger period which is essential for the development of the plants (less irrigation needed). As variations in the beginning and ending of the rainy season were detected, a further analysis is required.

The scores of the UI that were found during all the years of the study period range from 1.1 to 8.3 and were divided into five sub-categories (classes). For the majority of the stations the greatest percentage of the cases (years) were found in the intermediate categories (from low to high uncertainty). However, from the average score values of the index, all the stations are characterized by medium and high uncertainty. The greatest mean value (3.4) was found at the station of Athens, the city that was subjected to the most intense urban development during the study period. This could be an indication that the expansion of a city, the growth of the population and more intense thermal urban effect (Philandras et al., 1998; Makrogiannis et al., 1999) may play an important role in the increase of the rainfall uncertainty. At this point, it is worth mentioning that the Attica basin is one of the few regions where precipitation amounts and frequencies do not present a significant decrease in the last 50 years, as in the rest of Greece (Maheras and Anagnostopoulou, 2003). It could be attributed to the great urbanization of this area.

Finally, it was important to examine if the index could be applied in different regions in order to quantify the uncertainty of rainfall and to make the results comparable. So, the same analysis was employed for a number of stations all over the European region. It was found that the number of the years and the percentage of each one of the five classes was more or less the same as the one in the Greek stations. This could be an indication that the classification of the uncertainty index is applicable in other regions also, with different climatic characteristics. In our opinion, the high uncertainty presented in some of the European stations may be attributed to the changes in the circulation conditions that influence the rainfall regime of the stations.

Undoubtedly, the uncertainty index needs further investigation. The authors orientate for a future work, to apply the UI in different regions, with different climatic characteristics, aiming on the validation of the index. Also, the application of the index employing GCM and RCM data in order to estimate the uncertainty of simulated time series could contribute to a more thorough evaluation of the models.

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